

# The Landscape of Structural Graph Parameters

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## Introduction

- ❖ FPT theory in 30 seconds
- ❖ Vertex Cover
- ❖ Search tree algorithm
- ❖ So what?
- ❖ Parameterized Zoo
- ❖ Methodology
- ❖ What parameter to choose?

Graph Widths and  
Meta-Theorems

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Vertex Cover and  
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# Introduction



# FPT theory in 30 seconds

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## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

## Conclusions

- Most problems are NP-hard → need exp time in the worst case
- They may be easily solvable in some special cases
  - ❖ Typically for graph problems, when the graph is a tree
- What about the almost easy cases?
  - ❖ We consider the concept of “distance from triviality”



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- Examples:



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- They may be easily solvable in some special cases
  - ❖ Typically for graph problems, when the graph is a tree
- What about the almost easy cases?
  - ❖ We consider the concept of “distance from triviality”
- Examples:
  - ❖ Satisfying  $\frac{7}{8}m$  of the clauses of a 3-CNF formula
  - ❖ Satisfying  $\frac{7}{8}m+k$  of the clauses of a 3-CNF formula



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- They may be easily solvable in some special cases
  - ❖ Typically for graph problems, when the graph is a tree
- What about the almost easy cases?
  - ❖ We consider the concept of “distance from triviality”
- Examples:
  - ❖ Euclidean TSP on a convex set of points
  - ❖ Euclidean TSP when all but  $k$  of the points lie on the convex hull



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- They may be easily solvable in some special cases
  - ❖ Typically for graph problems, when the graph is a tree
- What about the almost easy cases?
  - ❖ We consider the concept of “distance from triviality”
- Examples:
  - ❖ Vertex Cover on bipartite graphs
  - ❖ Vertex Cover on graphs with small bipartization number



# Vertex Cover

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- Vertex Cover is NP-hard in general.
- It is easy (in P) on bipartite graphs.
  - ❖ Maximum matching, König's theorem
- What about almost bipartite graphs?
  - ❖ Is there an efficient algorithm for Vertex Cover on graphs where the number of vertices/edges one needs to delete to make the input graph bipartite is small?
- Assume for now that some small bipartizing set is given.





# Search tree algorithm

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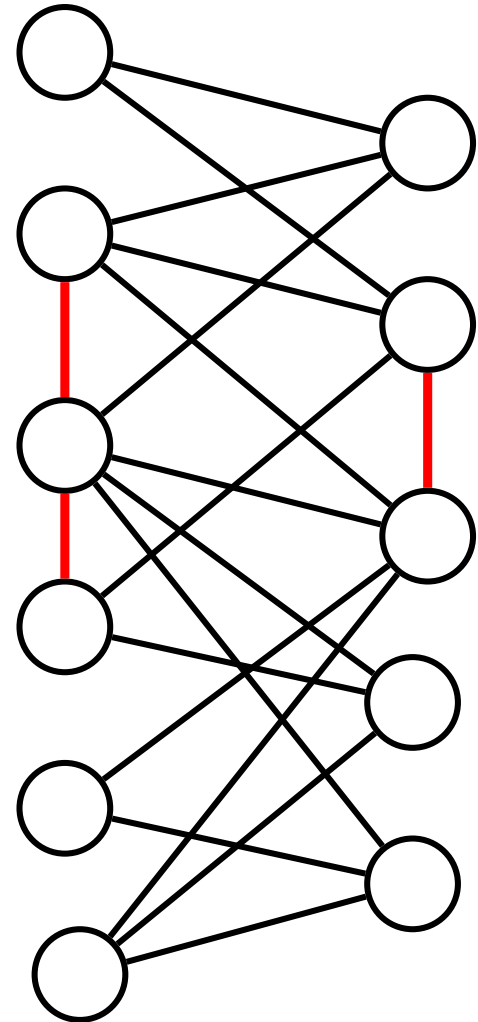
❖ What parameter to choose?

Graph Widths and Meta-Theorems

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Conclusions

- Suppose we have an almost bipartite graph. We cannot use König's theorem to find its minimum vertex cover.
- However, we can try to get rid of the offending vertices/edges.



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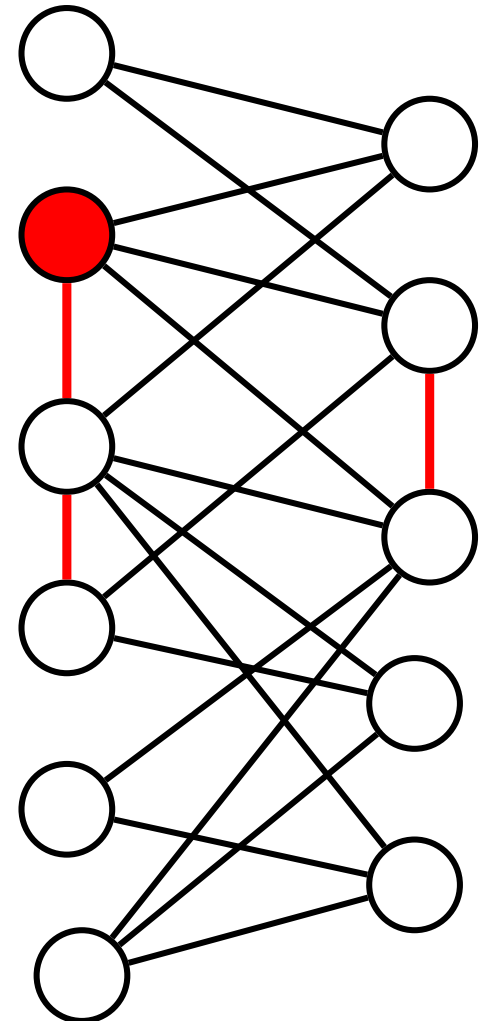
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## Conclusions

- Pick an offending edge. Either its first endpoint must be in the optimal vertex cover ...



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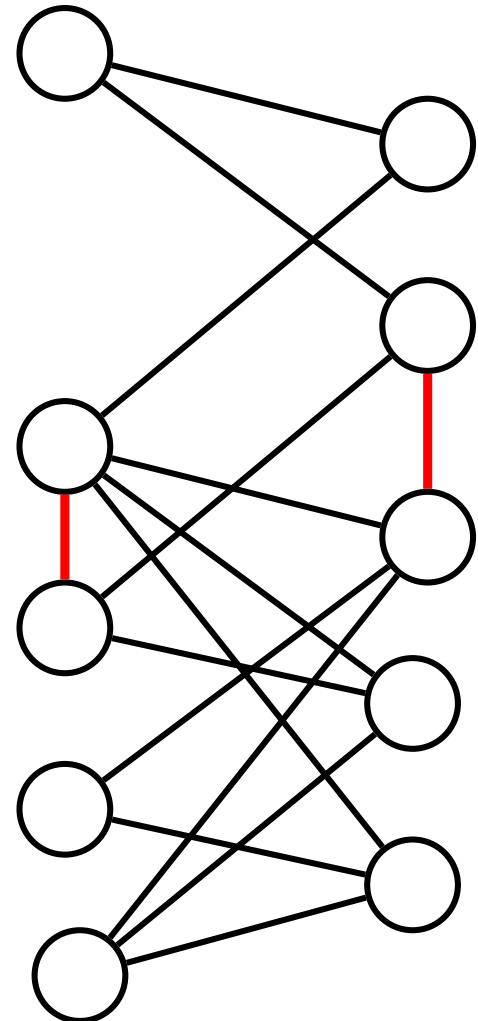
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Graph Widths and Meta-Theorems

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Conclusions

- Pick an offending edge. Either its first endpoint must be in the optimal vertex cover ...
- So, we should remove it...



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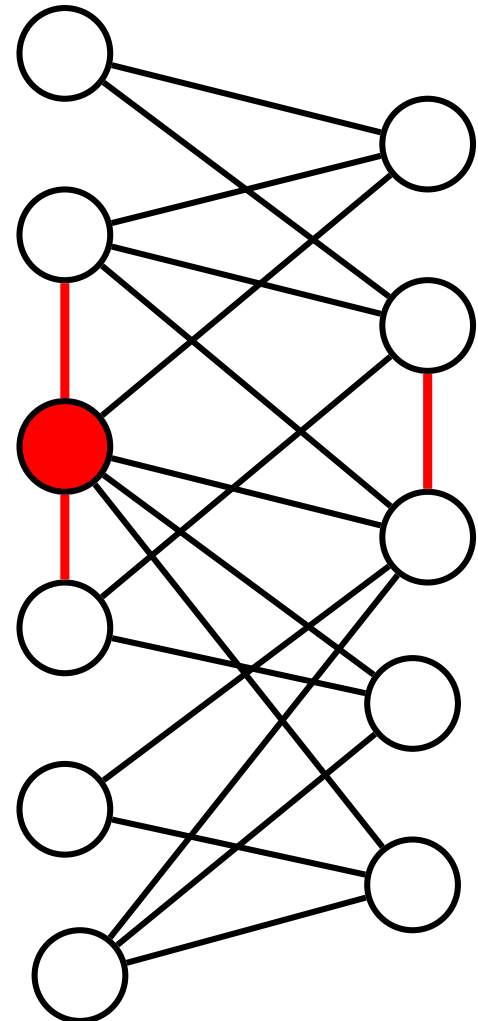
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## Graph Widths and Meta-Theorems

### Vertex Cover and Max-Leaf

## Conclusions

- ... or its other endpoint is in the optimal cover ...



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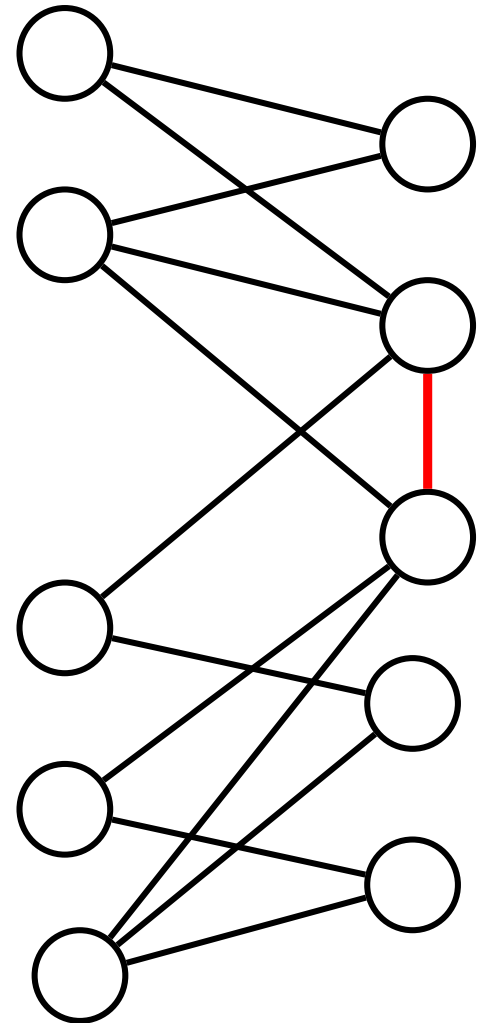
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- ... or its other endpoint is in the optimal cover ...
- So, we can remove it.



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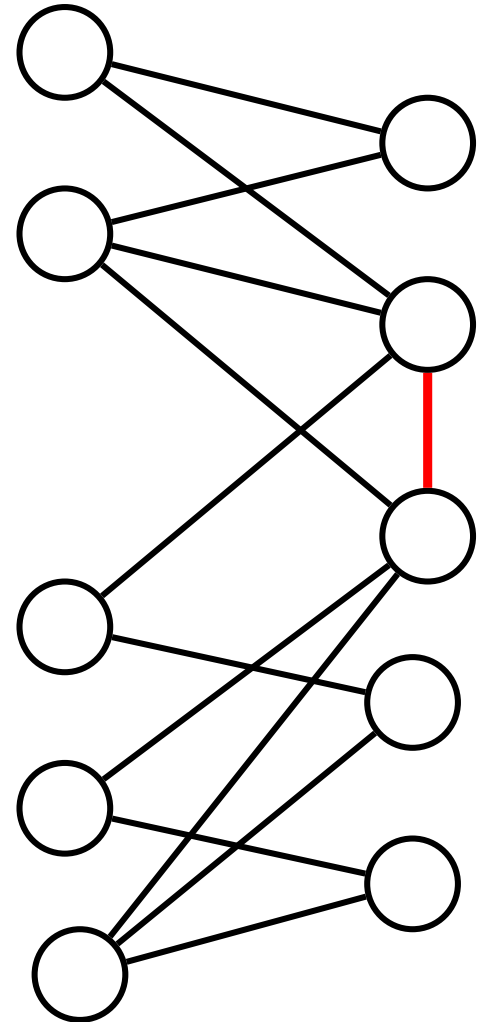
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Conclusions

- We have produced two instances, one equivalent to the original.
- Both are **closer** to being bipartite.



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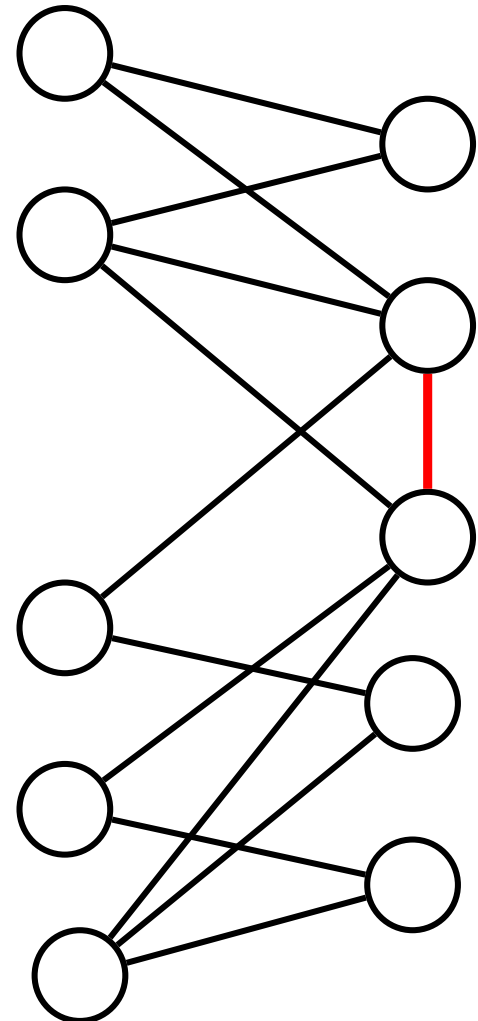
❖ What parameter to choose?

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Conclusions

- Continuing like this, we produce  $2^k$  instances, where  $k$  is original distance from bipartite-ness.
- These are all **bipartite**. → Use poly-time algorithm to find the best.



# Search tree algorithm

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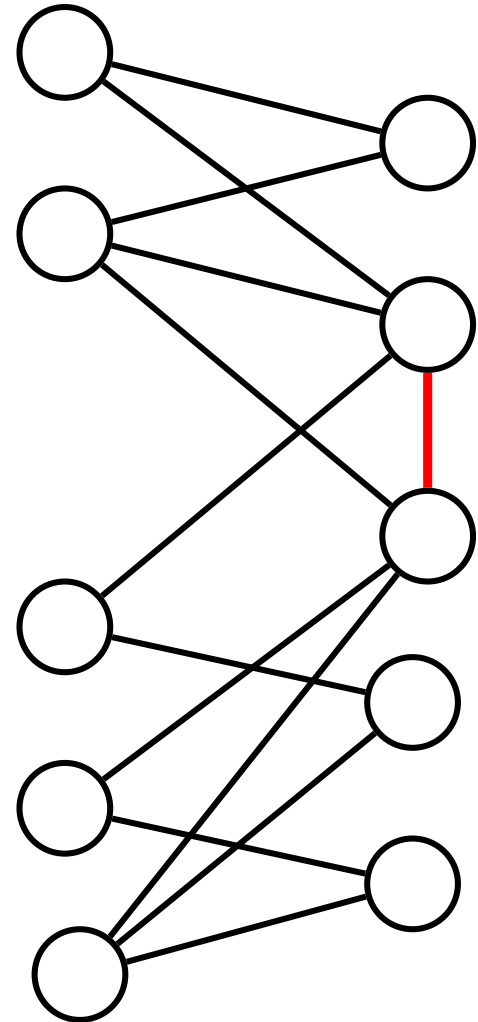
❖ What parameter to choose?

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## Conclusions

- This is known as a *bounded-depth search tree* algorithm. It's essentially a brute-force approach, confined to  $k$ .
- Total running time:  $2^k n^c$ .





# So what?

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- This is too easy! Hence, boring...
- This is just a cooked-up example...
- This isn't really new...



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Conclusions

- This is too easy! Hence, boring...
  - ❖ This doesn't work for all problems! 3-coloring is NP-hard for  $k = 3$  [Cai 2002]
- This is just a cooked-up example...
- This isn't really new...



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Conclusions

- This is too easy! Hence, boring...
- This is just a cooked-up example...
  - ❖ True. But we can work this way with countless other problems/graph families. Some cases are bound to be interesting.
- This isn't really new...



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Conclusions

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- This is too easy! Hence, boring...
- This is just a cooked-up example...
- This isn't really new...
  - ❖ Novelty here is the pursuit of upper/lower bounds with respect to  $n$  and  $k$ .



# Parameterized Zoo

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Classical		Parameterized	
Running time	Examples	Running time	Examples
$2^{O(n)}$	Clique, DS, TSP, VC		
$n^c$	MM, MST		

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$2^{O(n)}$	Clique, DS, TSP, VC		
$n^{poly \log n}$	VC-d	$n^k$	pS-DS, pS-Clique, pFVS-CapVC
		$2^{O(k)} n^c$	pS-VC, pBP-VC, pFVS-DS
$n^c$	MM, MST		



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		$2^{O(k^3)} n^c$	pS-Treewidth
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		$2^{O(k)} n^c$	pS-VC, pBP-VC, pFVS-DS
		$2^{O(\sqrt{k})} n^c$	Planar pS-VC, Planar pS-DS, pS-FAST
$n^c$	MM, MST		

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$n^{\text{poly log } n}$	VC-d	$n^k$	pS-DS, pS-Clique, pFVS-CapVC
NP-hardness		$2^{O(k^3)} n^c$	pS-Treewidth
		$2^{O(k)} n^c$	pS-VC, pBP-VC, pFVS-DS
		$2^{O(\sqrt{k})} n^c$	Planar pS-VC, Planar pS-DS, pS-FAST
$n^c$	MM, MST		

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Classical		Parameterized		
Running time	Examples	Running time	Examples	
$2^{O(n)}$	Clique, DS, TSP, VC	$n^k$ ← <b>W-hardness</b>	pS-DS, pS-Clique, pFVS-CapVC	
$n^{poly \log n}$	VC-d		$2^{O(k^3)} n^c$	pS-Treewidth
$n^c$ ← <b>NP-hardness</b>	MM, MST		$2^{O(k)} n^c$	pS-VC, pBP-VC, pFVS-DS
			$2^{O(\sqrt{k})} n^c$	Planar pS-VC, Planar pS-DS, pS-FAST

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Running time	Examples	Running time	Examples
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$n^{poly \log n}$	VC-d		
$n^c$	<b>NP-hardness</b> MM, MST		

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Conclusions

- First objective: prove that a problem is FPT ( $f(k) \cdot n^c$ )
  - ❖ Positive toolbox (algorithmic techniques)
  - ❖ Negative toolbox (W-hardness reductions)
    - Parameter-preserving reductions from known hard problems (Independent set, Dominating set ...)
  - ❖ Second objective: get the best  $f(k)$   
( $2^{2^k} > 2^{k^2} > k^k > 3^k > 2^k$ )
    - Positive toolbox (algorithmic techniques)
    - Negative toolbox (reductions from ETH)
      - ◆ The assumption that 3-SAT cannot be solved in  $2^{o(n)}$ .



# What parameter to choose?

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Conclusions

- We would like to define the parameter so that:
  - ❖ As many instances as possible have small  $k$ .
  - ❖ We can design an algorithm that works well for small  $k$  (FPT).
- These are conflicting goals! Picking a good parameter is hard work!
- One approach: “natural” parameterizations:  $k$  is the value of the objective function.



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  - ❖ We can design an algorithm that works well for small  $k$  (FPT).
- These are conflicting goals! Picking a good parameter is hard work!
- One approach: “natural” parameterizations:  $k$  is the value of the objective function.
- Here: **Structural** parameterizations:  $k$  is some measure of the complexity of the input graph/instance.
- Example: How about Vertex Cover in graphs with FVS of size  $k$ ?



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### Graph Widths and Meta-Theorems

- ❖ Graph widths
- ❖ A complexity map
- ❖ Algorithmic  
Meta-Theorems
- ❖ First Order Logic  
on graphs
- ❖ (Monadic) Second  
Order Logic
- ❖ The model  
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- ❖ Courcelle's  
theorem

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# Graph Widths and Meta-Theorems





# Structural Parameters

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### Graph Widths and Meta-Theorems

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## Conclusions

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- Time to think a little harder about our choice of parameters.
- We will now investigate the algorithmic and graph-theoretic properties of various measures that quantify graph complexity.
  - ❖ ... an area known as the theory of graph “widths”.



# Graph widths

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### Graph Widths and Meta-Theorems

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## Conclusions

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- The most popular structural parameters for graphs are the various graph “widths”.
- Their king is **treewidth**.
  - ❖ Treewidth quantifies how “close” a graph is to being a tree.
  - ❖ Treewidth strikes a good balance between our two goals.
- A surprisingly robust notion, rediscovered independently several times
  - ❖ Arnborg and Proskurowski (partial  $k$ -trees), Robertson and Seymour (tree decompositions), Kirousis and Papadimitriou (node searching), . . .



# Graph widths

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### Graph Widths and Meta-Theorems

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- The most popular structural parameters for graphs are the various graph “widths”.
- Their king is **treewidth**.
  - ❖ Treewidth quantifies how “close” a graph is to being a tree.
  - ❖ Treewidth strikes a good balance between our two goals.
- What other “widths” are there? What are their properties? What are the relationships between them and with other graph invariants?



# A complexity map

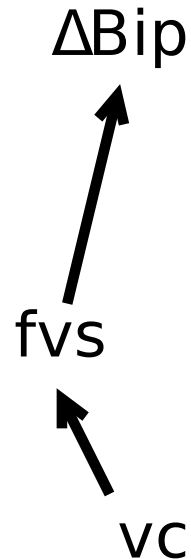
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- ❖ Graph widths
- ❖ **A complexity map**
- ❖ Algorithmic Meta-Theorems
- ❖ First Order Logic on graphs
- ❖ (Monadic) Second Order Logic
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## Vertex Cover and Max-Leaf

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Algorithms



Hardness

Recall two reasonable parameters. What is the trade-off between generality and algorithms?



# A complexity map

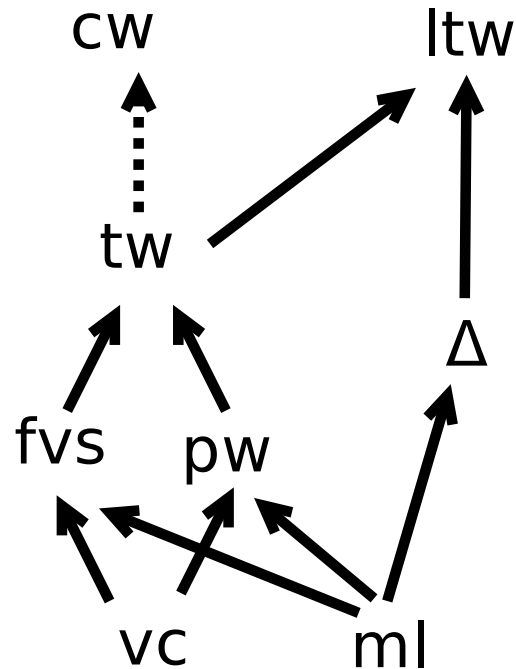
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Hardness

vc = Vertex Cover, ml = Max-Leaf, fvs = Feedback Vertex Set, pw = Pathwidth, tw = Treewidth, cw = Cliquewidth, ltw = Local Treewidth,  $\Delta$  = Max Degree



# A complexity map

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### ❖ Graph widths

### ❖ A complexity map

### ❖ Algorithmic Meta-Theorems

### ❖ First Order Logic on graphs

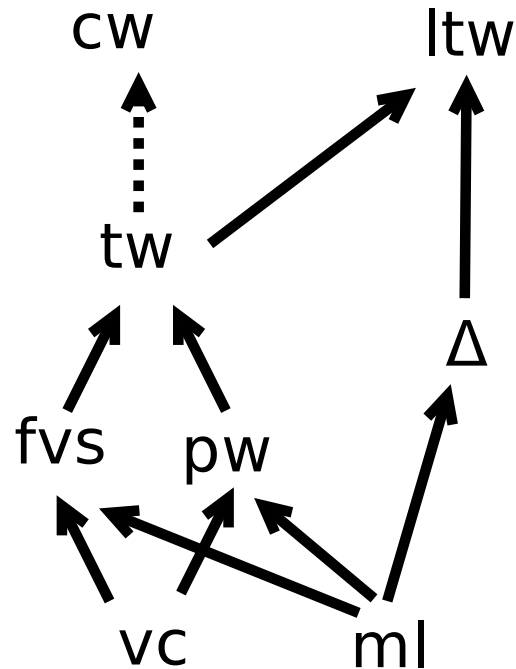
### ❖ (Monadic) Second Order Logic

### ❖ The model checking problem

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Hardness

Algorithmic implications: positive (FPT) results propagate downward, negative (hardness) results propagate upward



# A complexity map

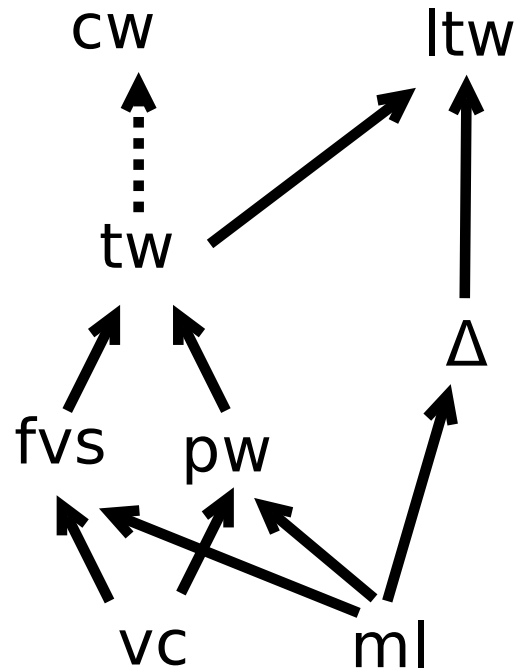
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Algorithms



Hardness

This map gives us a basic idea of how general each width is.



# Algorithmic Meta-Theorems

## Introduction

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### Graph Widths and Meta-Theorems

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- ❖ Graph widths
- ❖ A complexity map
- ❖ **Algorithmic Meta-Theorems**
- ❖ First Order Logic on graphs
- ❖ (Monadic) Second Order Logic
- ❖ The model checking problem
- ❖ Courcelle's theorem

### Vertex Cover and Max-Leaf

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## Conclusions

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- Algorithmic Theorems

- ❖ Vertex Cover, Dominating Set, 3-Coloring are solvable in linear time on graphs of constant treewidth.





# Algorithmic Meta-Theorems

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### Graph Widths and Meta-Theorems

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## Conclusions

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- Algorithmic **Meta**-Theorems
  - ❖ All **MSO-expressible** problems are solvable in linear time on graphs of constant treewidth.
- Main uses: quick complexity classification tools, mapping the limits of applicability for specific techniques.
- Also: evaluating the algorithmic potency of a parameter.
- To prove such theorems we should be able to group families of problems together. Method here: expressibility in certain logics.



# First Order Logic on graphs

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## Conclusions

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- We express graph properties using logic
- Basic vocabulary
  - ❖ Vertex variables:  $x, y, z, \dots$



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  - ❖ Boolean connectives  $\vee, \wedge, \neg$



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  - ❖ Quantifiers  $\forall, \exists$



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  - ❖ Boolean connectives  $\vee, \wedge, \neg$
  - ❖ Quantifiers  $\forall, \exists$

Example: Dominating Set of size 2

$$\exists x_1 \exists x_2 \forall y E(x_1, y) \vee E(x_2, y) \vee x_1 = y \vee x_2 = y$$



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  - ❖ Edge predicate  $E(x, y)$ , Equality  $x = y$
  - ❖ Boolean connectives  $\vee, \wedge, \neg$
  - ❖ Quantifiers  $\forall, \exists$

## Example: Vertex Cover of size 2

$$\exists x_1 \exists x_2 \forall y \forall z E(y, z) \rightarrow (y = x_1 \vee y = x_2 \vee z = x_1 \vee z = x_2)$$



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  - ❖ Vertex variables:  $x, y, z, \dots$
  - ❖ Edge predicate  $E(x, y)$ , Equality  $x = y$
  - ❖ Boolean connectives  $\vee, \wedge, \neg$
  - ❖ Quantifiers  $\forall, \exists$

Example: Clique of size 3

$$\exists x_1 \exists x_2 \exists x_3 E(x_1, x_2) \wedge E(x_2, x_3) \wedge E(x_1, x_3)$$





# First Order Logic on graphs

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- We express graph properties using logic
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  - ❖ Edge predicate  $E(x, y)$ , Equality  $x = y$
  - ❖ Boolean connectives  $\vee, \wedge, \neg$
  - ❖ Quantifiers  $\forall, \exists$

Example: Many standard (parameterized) problems can be expressed in FO logic. But some easy problems are inexpressible (e.g. connectivity).

Rule of thumb: FO = local properties



# (Monadic) Second Order Logic

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### Vertex Cover and Max-Leaf

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## Conclusions

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- MSO logic: we add set variables  $S_1, S_2, \dots$  and a  $\in$  predicate. We are now allowed to quantify over sets.
  - ❖  $\text{MSO}_1$  logic: we can quantify over sets of vertices only
  - ❖  $\text{MSO}_2$  logic: we can quantify over sets of edges



# (Monadic) Second Order Logic

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## Conclusions

- MSO logic: we add set variables  $S_1, S_2, \dots$  and a  $\in$  predicate. We are now allowed to quantify over sets.
  - ❖  $\text{MSO}_1$  logic: we can quantify over sets of vertices only
  - ❖  $\text{MSO}_2$  logic: we can quantify over sets of edges

## Example: 2-coloring

$$\exists V_1 \exists V_2$$

$$(\forall x \forall y E(x, y) \rightarrow (x \in V_1 \leftrightarrow y \in V_2))$$

$$(\forall z (z \in V_1 \vee z \in V_2))$$



# (Monadic) Second Order Logic

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## Conclusions

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  - ❖  $\text{MSO}_1$  logic: we can quantify over sets of vertices only
  - ❖  $\text{MSO}_2$  logic: we can quantify over sets of edges
- $\text{MSO}_2 \neq \text{MSO}_1$ . Examples: Hamiltonicity, Edge dominating set



# (Monadic) Second Order Logic

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## Conclusions

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- MSO logic: we add set variables  $S_1, S_2, \dots$  and a  $\in$  predicate. We are now allowed to quantify over sets.
  - ❖  $\text{MSO}_1$  logic: we can quantify over sets of vertices only
  - ❖  $\text{MSO}_2$  logic: we can quantify over sets of edges
- Optimization variants of MSO exist, questions of the form find min  $S$  s.t.  $\phi(S)$  holds.



# The model checking problem

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## Conclusions

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### Problem: **p-Model Checking**

Input: Graph  $G$  of width  $k$  and formula  $\phi$

Parameter:  $|\phi| + k$

Question:  $G \models \phi?$

- The unparameterized problem is PSPACE-hard, even for FO logic on trivial graphs.



# The model checking problem

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## Conclusions

### Problem: **p-Model Checking**

Input: Graph  $G$  of width  $k$  and formula  $\phi$

Parameter:  $|\phi| + k$

Question:  $G \models \phi$ ?

- If  $|\phi|$  is a constant, problem is in XP for FO logic, NP-hard for  $\text{MSO}_1$ .
  - ❖ For FO logic, try all possibilities for each variable.
  - ❖ For MSO logic, 3-coloring is expressible with a constant-size formula.



# The model checking problem

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### Problem: **p-Model Checking**

Input: Graph  $G$  of width  $k$  and formula  $\phi$

Parameter:  $|\phi| + k$

Question:  $G \models \phi?$

- Parameterized just by  $|\phi|$ , this problem is W-hard even for FO logic
  - ❖ The property “the graph has a clique of size  $t$ ” can be encoded in an FO formula of size  $O(t)$





# The model checking problem

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## Conclusions

### Problem: **p-Model Checking**

Input: Graph  $G$  of width  $k$  and formula  $\phi$

Parameter:  $|\phi| + k$

Question:  $G \models \phi?$

- We are interested in finding tractable, i.e. FPT, cases for the doubly parameterized case.



# Courcelle's theorem

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## Conclusions

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- Every graph property expressible in  $\text{MSO}_2$  logic is solvable in linear time on graphs of bounded treewidth.
  - ❖ Automata-theoretic proof, show that MSO graph properties have finite index.
  - ❖ Most celebrated result in this area. One of the reasons everyone loves treewidth.



# Courcelle's theorem

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### Vertex Cover and Max-Leaf

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## Conclusions

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- Every graph property expressible in  $\text{MSO}_2$  logic is solvable in linear time on graphs of bounded treewidth.
- More formally: There exists an algorithm which, given an  $\text{MSO}_2$  formula  $\phi$  and a graph  $G$  with  $n$  vertices and treewidth  $k$  decides if  $G \models \phi$  in time  $f(k, |\phi|) \cdot n$ .



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- Can we do better?
  - ❖ Faster?
  - ❖ More graphs?
  - ❖ Wider logic?



# Courcelle's theorem

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- Can we do better?
  - ❖ Faster?
    - Better than linear time is impossible! But  $f$  is a tower of exponentials with height proportional to  $|\phi|$ . Huge room for improvement?
  - ❖ More graphs?
  - ❖ Wider logic?



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- Can we do better?
  - ❖ Faster?
  - ❖ More graphs?
    - This has been extended to cliquewidth for  $\text{MSO}_1$  logic [Courcelle, Makowsky, Rotics 2000]. It is impossible for  $\text{MSO}_2$  [Fomin, Golovach, Lokshtanov, Saurabh 2009].
  - ❖ Wider logic?



# Courcelle's theorem

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- Can we do better?
  - ❖ Faster?
  - ❖ More graphs?
  - ❖ Wider logic?
    - ?



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- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
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## Conclusions

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# Vertex Cover and Max-Leaf





# Graph classes

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❖ Some newer meta-theorems

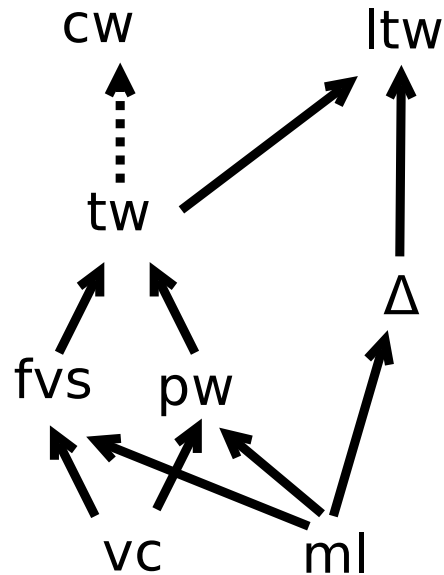
❖ Vertex cover - FO  
❖ Max-Leaf Number - FO

❖ Vertex Cover - MSO

❖ Generalizing

❖ Neighborhood Diversity

## Conclusions



- FO logic is FPT for all,  $\text{MSO}_1$  for the blue area,  $\text{MSO}_2$  for the green area.
- FO logic is non-elementary for trees, triply exponential for binary trees. [Frick and Grohe 2004]



# Graph classes

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❖ Vertex cover - FO

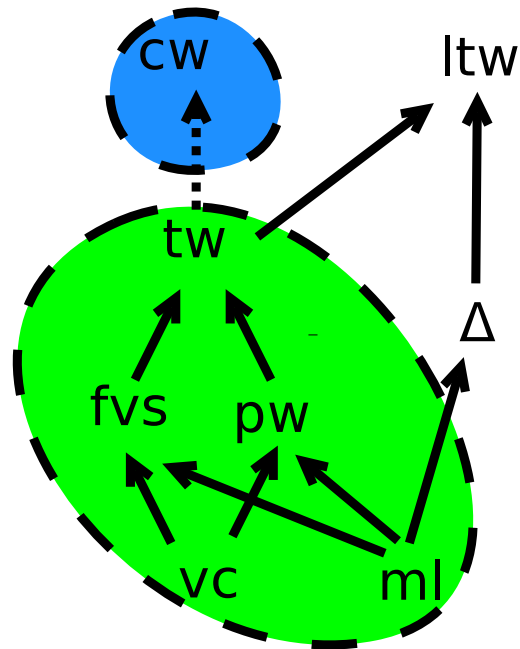
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# Graph classes

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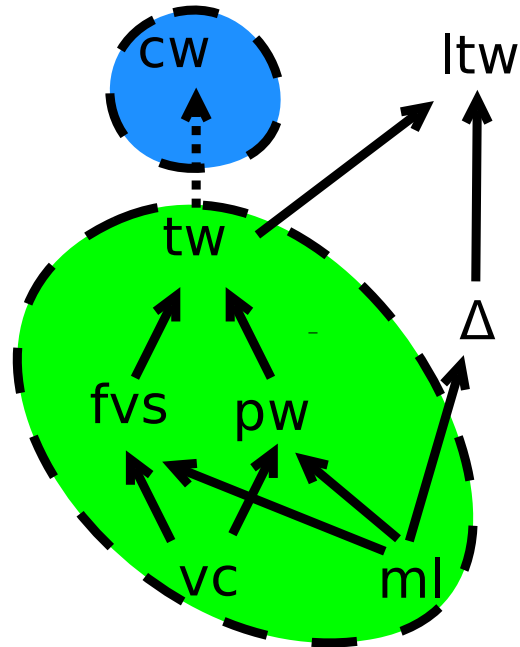
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❖ Generalizing

❖ Neighborhood Diversity

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Our focus is on improving on the bottom.

# Some newer meta-theorems

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❖ Vertex cover - FO

❖ Max-Leaf Number  
- FO

❖ Vertex Cover -  
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❖ Neighborhood  
Diversity

Conclusions

- FO logic for graphs of bounded vertex cover is singly exponential
- FO logic for graphs of bounded max-leaf number is singly exponential
- MSO logic for graphs of bounded vertex cover is doubly exponential
- Tight lower bounds (under the ETH) for vertex cover

([L. ESA 2010])



# Vertex cover - FO

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- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
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## Conclusions

---

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.



# Vertex cover - FO

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### ❖ Max-Leaf Number - FO

### ❖ Vertex Cover - MSO

### ❖ Generalizing

### ❖ Neighborhood Diversity

## Conclusions

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Intuition:
  - ❖ Model checking FO logic on general graphs is in XP: each time we see a quantifier, we try all possible vertices.
  - ❖ The existence of a vertex cover of size  $k$  partitions the remainder of the graph into at most  $2^k$  sets of vertices, depending on their neighbors in the vertex cover.
  - ❖ Crucial point: Trying all possible vertices in a set is wasteful. One representative suffices.



# Vertex cover - FO

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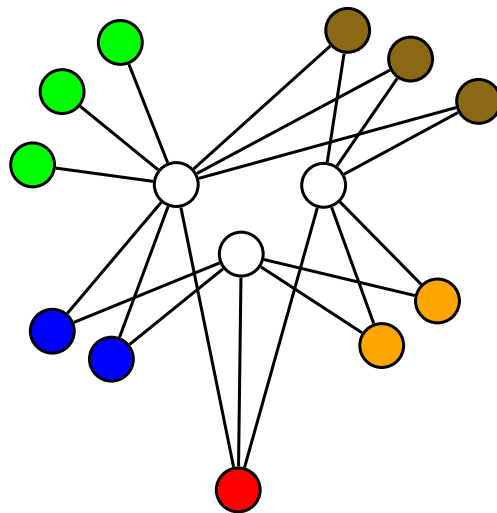
❖ Vertex Cover - MSO

❖ Generalizing

❖ Neighborhood Diversity

## Conclusions

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Definition:  $u, v$  have the same type iff  $N(u) \setminus \{v\} = N(v) \setminus \{u\}$ .
- Lemma: If  $\phi(x)$  is a FO formula with a free variable and  $u, v$  have the same type then  $G \models \phi(u)$  iff  $G \models \phi(v)$ .



# Vertex cover - FO

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### ❖ Vertex Cover - MSO

### ❖ Generalizing

### ❖ Neighborhood Diversity

## Conclusions

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Algorithm: For each of the  $q$  quantified vertex variables in the formula try the following
  - ❖ Each of the vertices of the vertex cover ( $k$  choices)
  - ❖ Each of the previously selected vertices ( $q$  choices)
  - ❖ An arbitrary representative from each type ( $2^k$  choices)
- Total time:  $O^*(k + q + 2^k)^q = O^*(2^{kq+q \log q})$





# Vertex cover - FO

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## Conclusions

- Model checking FO logic on graphs of bounded vertex cover is singly exponential.
- Algorithm: For each of the  $q$  quantified vertex variables in the formula try the following
  - ❖ Each of the vertices of the vertex cover ( $k$  choices)
  - ❖ Each of the previously selected vertices ( $q$  choices)
  - ❖ An arbitrary representative from each type ( $2^k$  choices)
- Total time:  $O^*(k + q + 2^k)^q = O^*(2^{kq+q \log q})$
- Recall: Courcelle's theorem gives a tower of exponentials here



# Max-Leaf Number - FO

## Introduction

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## Graph Widths and Meta-Theorems

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## Vertex Cover and Max-Leaf

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- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

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- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .



# Max-Leaf Number - FO

## Introduction

### Graph Widths and Meta-Theorems

### Vertex Cover and Max-Leaf

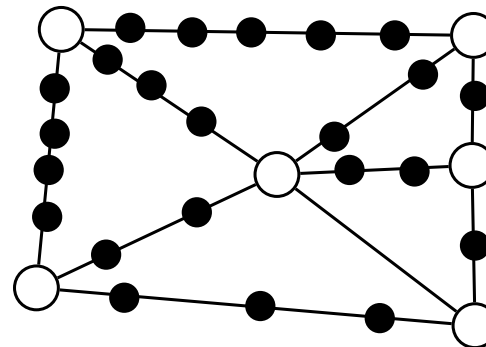
- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO

### Vertex Cover - MSO

- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .
- Again, small max-leaf number implies a special structure
  - ❖ Small degree and small pathwidth
  - ❖ [Kleitman and West 1991] A graph of max-leaf number  $k$  is a **sub-division** of a graph of at most  $O(k)$  vertices.



# Max-Leaf Number - FO

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ **Max-Leaf Number - FO**
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .
- Definition: a topo-edge is a vertex-maximal induced path
- The vast majority of vertices have degree 2 and belong in topo-edges



# Max-Leaf Number - FO

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO

## ❖ Vertex Cover - MSO

- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .
- Definition: a topo-edge is a vertex-maximal induced path
- The vast majority of vertices have degree 2 and belong in topo-edges
- Lemma: If a topo-edge has length at least  $2^q$  it can be shortened without affecting the truth value of any FO sentence with at most  $q$  quantifiers.



# Max-Leaf Number - FO

## Introduction

### Graph Widths and Meta-Theorems

### Vertex Cover and Max-Leaf

#### ❖ Graph classes

#### ❖ Some newer meta-theorems

#### ❖ Vertex cover - FO

#### ❖ Max-Leaf Number - FO

#### ❖ Vertex Cover - MSO

#### ❖ Generalizing

#### ❖ Neighborhood Diversity

## Conclusions

- The max-leaf number of graph  $ml(G)$  is the maximum number of leaves of any sub-tree of  $G$ .
- Definition: a topo-edge is a vertex-maximal induced path
- The vast majority of vertices have degree 2 and belong in topo-edges
- Lemma: If a topo-edge has length at least  $2^q$  it can be shortened without affecting the truth value of any FO sentence with at most  $q$  quantifiers.
- The graph can be reduced to size  $O(k^2 2^q)$  so the trivial FO algorithm runs in  $2^{O(q^2 + q \log k)}$



# Vertex Cover - MSO

## Introduction

## Graph Widths and Meta-Theorems

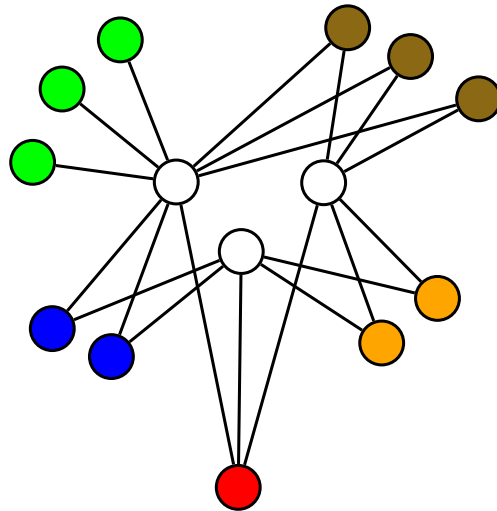
## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO

- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- Again, using partition of vertices into types.
- To decide  $\exists S \phi(S)$  we could try out all sets of vertices for  $S$  ( $2^n$  choices)
- But, the only thing that matters is **how many** vertices we pick from each type, not which.
- ...  $n^{2^k}$  choices. Still too many...



# Vertex Cover - MSO

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- Again, using partition of vertices into types.
- Main idea: if there are more than  $2^q$  vertices of a certain type, we can discard one.
- We end up with  $2^k \cdot 2^q$  vertices. Deciding if an MSO sentence holds takes exponential time:
  - ❖ Total running time:  $2^{2^{O(k+q)}}$





# Vertex Cover - MSO

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions

- Again, using partition of vertices into types.
- Main idea: if there are more than  $2^q$  vertices of a certain type, we can discard one.
- We end up with  $2^k \cdot 2^q$  vertices. Deciding if an MSO sentence holds takes exponential time:
  - ❖ Total running time:  $2^{2^{O(k+q)}}$
- Lower bound argument shows that this cannot be improved to  $2^{2^{o(k+q)}}$ , assuming the ETH.



# Generalizing

## Introduction

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## Graph Widths and Meta-Theorems

---

## Vertex Cover and Max-Leaf

---

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ **Generalizing**
- ❖ Neighborhood Diversity

## Conclusions

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- The only property of graphs of small vertex cover that we use is that they can be partitioned into few equivalence types.



# Generalizing

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

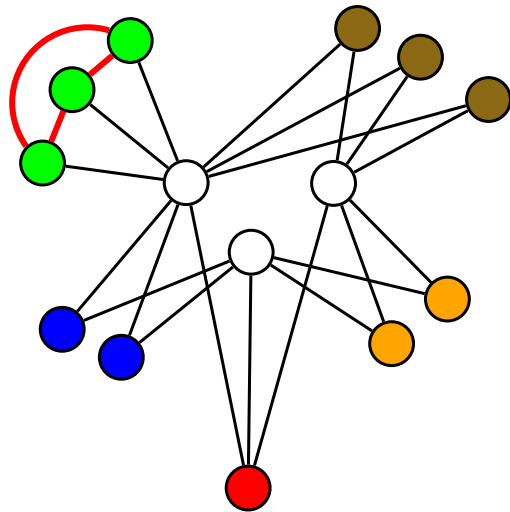
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- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO

## ❖ Generalizing

- ❖ Neighborhood Diversity

## Conclusions

- The only property of graphs of small vertex cover that we use is that they can be partitioned into few equivalence types.
- Even if each type is not an independent set, its vertices are still equivalent.



# Generalizing

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

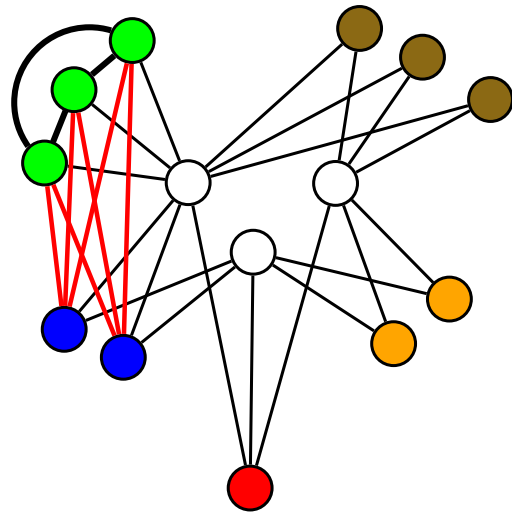
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- ❖ Vertex Cover - MSO

## ❖ Generalizing

- ❖ Neighborhood Diversity

## Conclusions

- The only property of graphs of small vertex cover that we use is that they can be partitioned into few equivalence types.
- Even if two types are connected, their vertices are still equivalent.



# Generalizing

## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
- ❖ Some newer meta-theorems
- ❖ Vertex cover - FO
- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO

## ❖ Generalizing

- ❖ Neighborhood Diversity

## Conclusions

- The only property of graphs of small vertex cover that we use is that they can be partitioned into few equivalence types.
- Definition: The neighborhood diversity of a graph  $G$  is the number of type equivalence classes of its vertices.
- Each class may induce a clique or an independent set.
- Two classes are either disconnected or fully connected.
- $\text{nd}(G)$  can be computed in polynomial time.



# Neighborhood Diversity

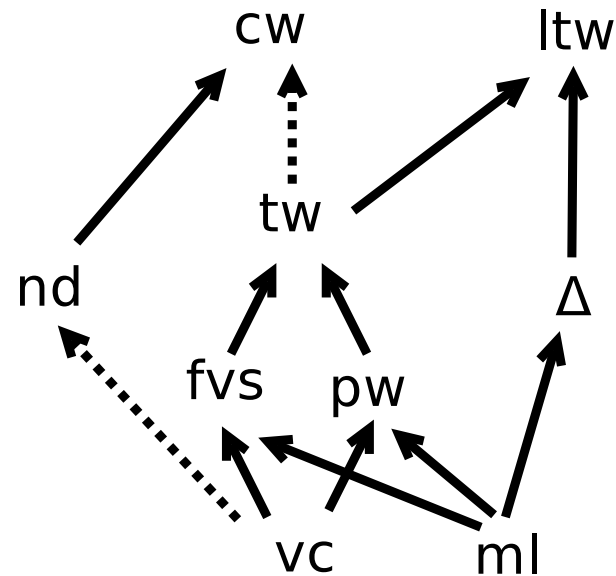
## Introduction

## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
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- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions



- All the meta-theorems for vertex cover naturally generalize to neighborhood diversity, with exponentially better running time.



# Neighborhood Diversity

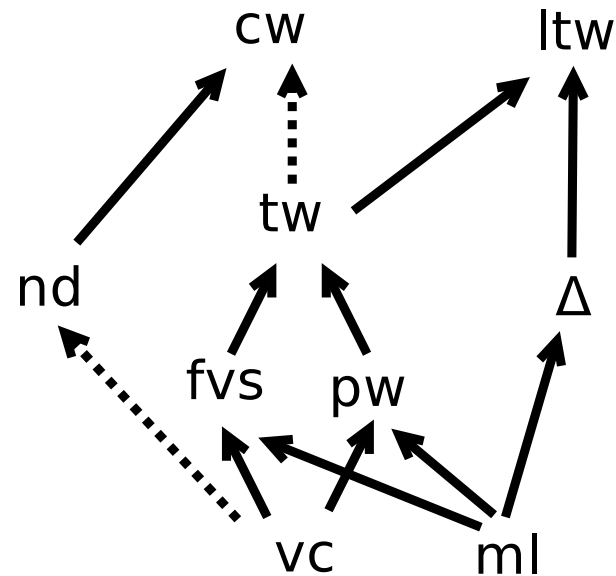
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## Graph Widths and Meta-Theorems

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- ❖ Graph classes
- ❖ Some newer meta-theorems
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- ❖ Neighborhood Diversity

## Conclusions



- nd is strictly more general than vertex cover, and incomparable to treewidth (think complete bipartite graphs).



# Neighborhood Diversity

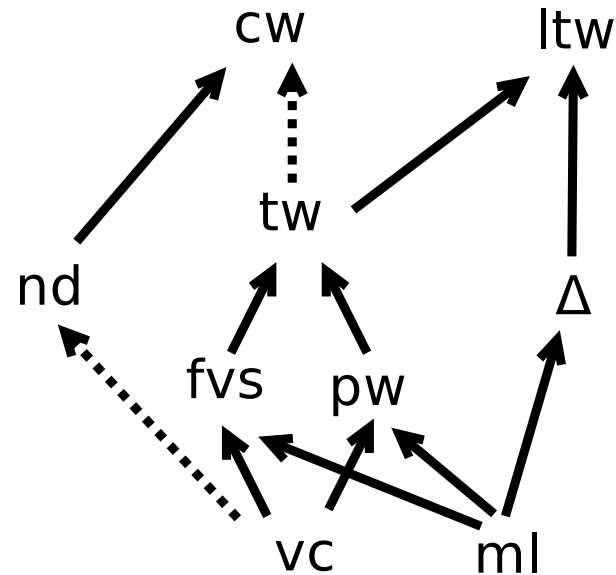
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## Graph Widths and Meta-Theorems

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- ❖ Graph classes
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- ❖ Neighborhood Diversity

## Conclusions



- It is a special case of clique-width. Several problems hard for clique-width are solvable for nd.





# Neighborhood Diversity

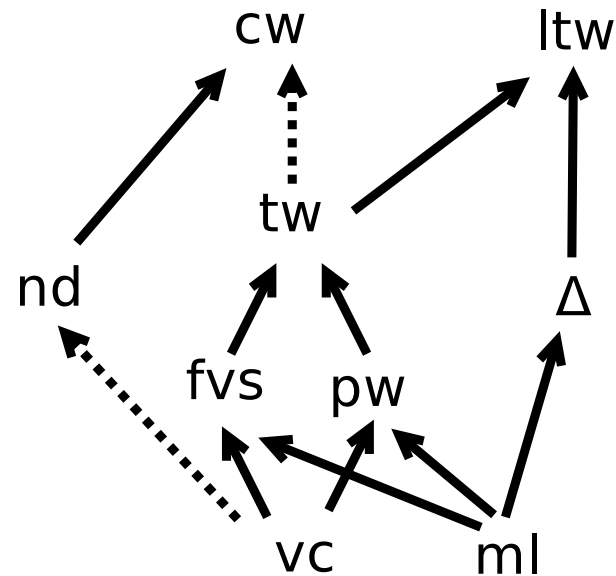
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## Graph Widths and Meta-Theorems

## Vertex Cover and Max-Leaf

- ❖ Graph classes
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- ❖ Max-Leaf Number - FO
- ❖ Vertex Cover - MSO
- ❖ Generalizing
- ❖ Neighborhood Diversity

## Conclusions



- Is this a realistic parameter?
- Recently ([Ganian 2011]) a similar (but incomparable) generalization of vertex cover was suggested. Can these two be merged?



Introduction

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Graph Widths and  
Meta-Theorems

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Vertex Cover and  
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**Conclusions**

❖ Open problems

# Conclusions



# Open problems

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Graph Widths and  
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❖ Open problems

- Structural parameterizations are a potentially large and still young research area.
- Need to explore more the properties of various widths.



# Open problems

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❖ Open problems

- Structural parameterizations are a potentially large and still young research area.
- Need to explore more the properties of various widths.
- Need to think harder about the way we define problem families.
  - ❖ What else is there besides FO and MSO logic?
  - ❖ Modal logic? [Pilipczuk 2011]



# Open problems

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❖ Open problems

- Structural parameterizations are a potentially large and still young research area.
- Need to explore more the properties of various widths.
- Need to think harder about the way we define problem families.
  - ❖ What else is there besides FO and MSO logic?
  - ❖ Modal logic? [Pilipczuk 2011]
- Concrete open problem:
  - ❖ MSO logic for max-leaf.
  - ❖ Interesting connections with (unary) regular language complexity.



# *The End*

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Meta-Theorems

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❖ Open problems

Thank you!  
Questions?

